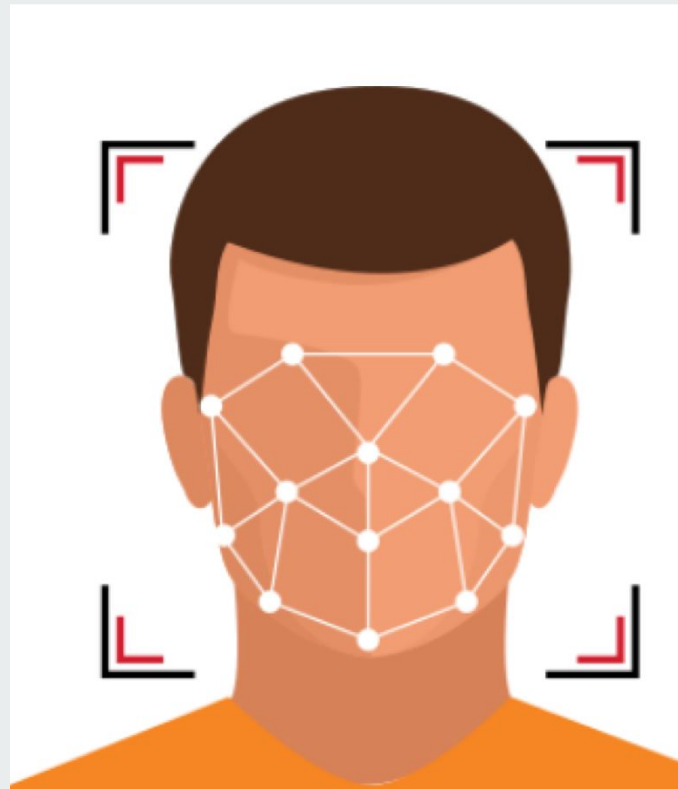


FACE TRACING

17-691 Machine Learning in Practice

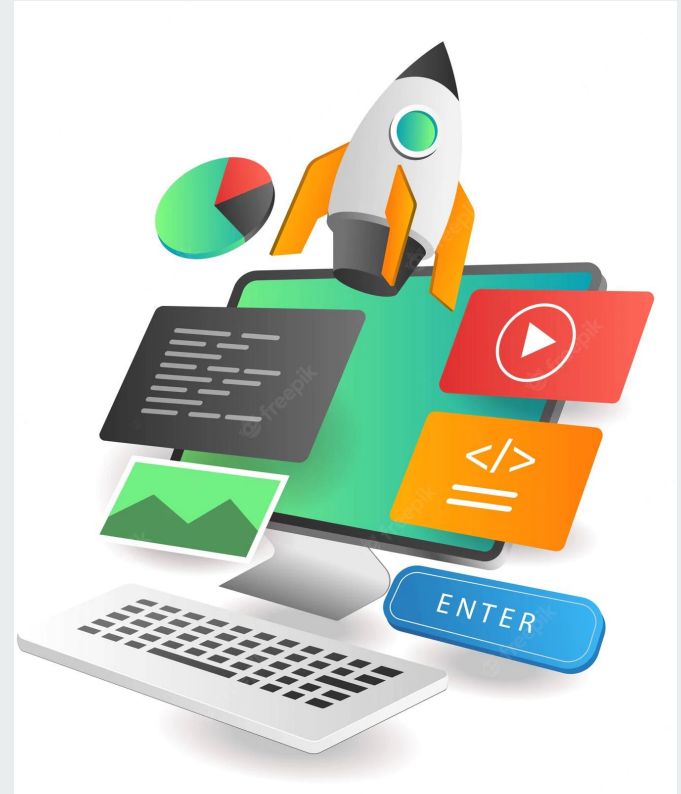
Group 6:

Chunying Li, Daniel Huang, Xiaoting Wang



1 - Product

Product Overview
AI Canvas
Product Team
Value Proposition
Business Model



Product Overview

Input



Facetracing

Output

00:24:10 - 00:25:20

00:35:04 - 00:40:32

01:02:01 - 01:03:56

01:14:43 - 01:15:00

01:25:39 - 01:34:28



AI Canvas

Opportunity

AI market is booming, Adoption for Image Recognition, Computer vision algo availability

Solution

An app using Image Recognition tech to locate target person in a video

Users

Youtubers who need to do a lot of video clipping. Law enforcement

Data

Videos and one target person picture

Strategy

Our product is the only product in the market provides such services. We will continue modifying our product based on demand in certain scenario

Product Team



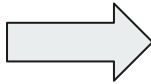
Xiaoting
Software
Engineer



Chunying
MLOps /
DevOps
Engineer



Daniel
Data
Scientist



AI Product Development Team



AI Product
Owner



Data Scientist



Data/Cloud
Engineer



Software Engineer



ML Infrastructure
Engineer



Agile Coach

Value for Users



30-60 minutes
editing



1-minute
finished video



24-hour
surveillance video

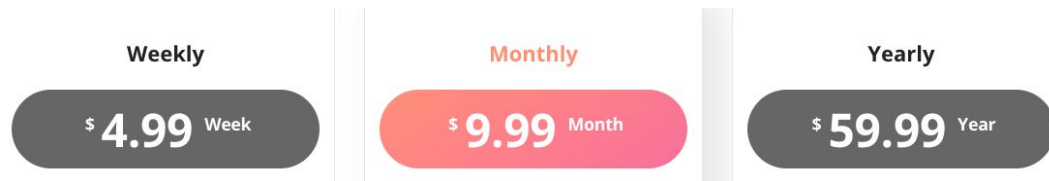


Time frames of
target suspects

Facetracing could help
find the target person
within seconds instead
of hours of human
work

Business Model

Subscription



One-Time Use

Video Length	One-Time Charge
<30 min	\$0.01/min
30 min - 120 min	\$0.02/min
>120 min	\$0.03/min



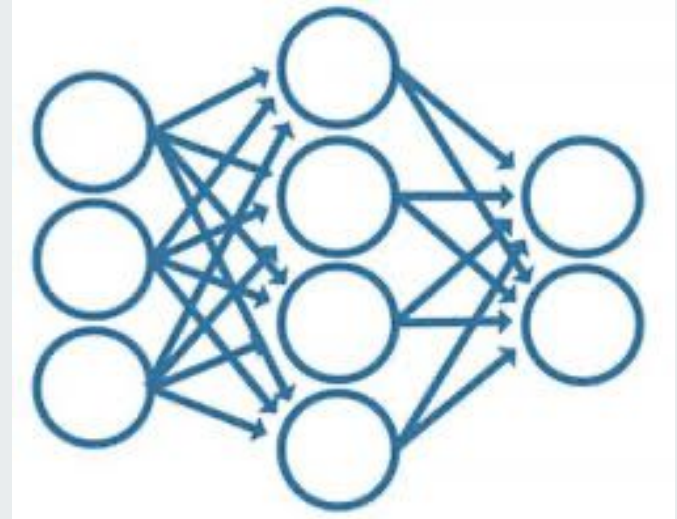
2 - Model

Model Iteration

Model Tuning and Metrics

Data Flywheel / Network Effect

Ethics and Governance



Model Iteration and Development

Compare
Each Frame with Uploaded Photo

Only Compare Frames
with Faces

Compare Face with
Faces

Self Reinforced Learning

Video
1m46s



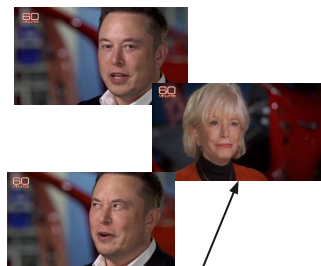
Compare

Photo



Cohen's
Kappa

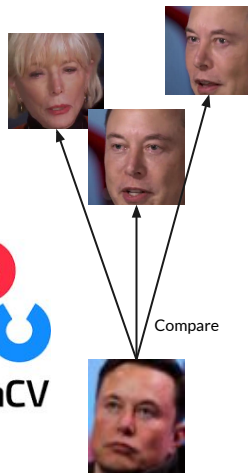
Kappa : 0.03
Time: 2m13s



Compare

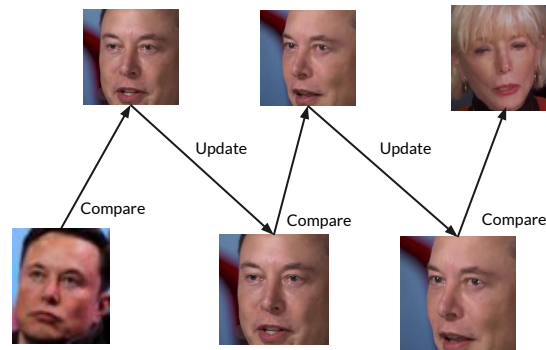


Kappa : 0.05
Time: 1m20s



Compare

Kappa : 0.18
Time: 22s



Update

Update

Kappa : 0.34
Time: 29s

...

Model Tuning and Metrics

01

Precision : Any wrong person?
Final: 1.0

- Very problematic for editing
- Priority at this stage
- Improve by Increasing threshold

02

Recall : Can we capture all frames?
Final: 0.52

- Less concerning at this stage
- Trade off with precision
- Required for future stages (Law Enforcement)

03

Time : How long does it take?
Final: 26.37s

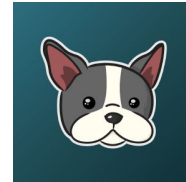
- Vary by computer
- Should not be longer than video itself
- Future deployment on Cloud

```
Test Paprameter: 0.000000
Accuracy: 0.613208
Precision: 0.700000
Recall: 0.155556
F1 score: 0.254545
Kappa: 0.118458
Wall time: 26.370000 s

Test Paprameter: 2.000000
Accuracy: 0.622642
Precision: 0.586207
Recall: 0.377778
F1 score: 0.459459
Kappa: 0.189912
Wall time: 26.370000 s

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Accuracy: 0.622642
Precision: 0.586207
Recall: 0.377778
F1 score: 0.459459
Kappa: 0.189912
Wall time: 26.370000 s
```



Best Parameters:

1. Pretrained Algorithms

Facenet

Facenet512

OpenFace

...

2. Distance Metrics

Cosine Similarity

Euclidean

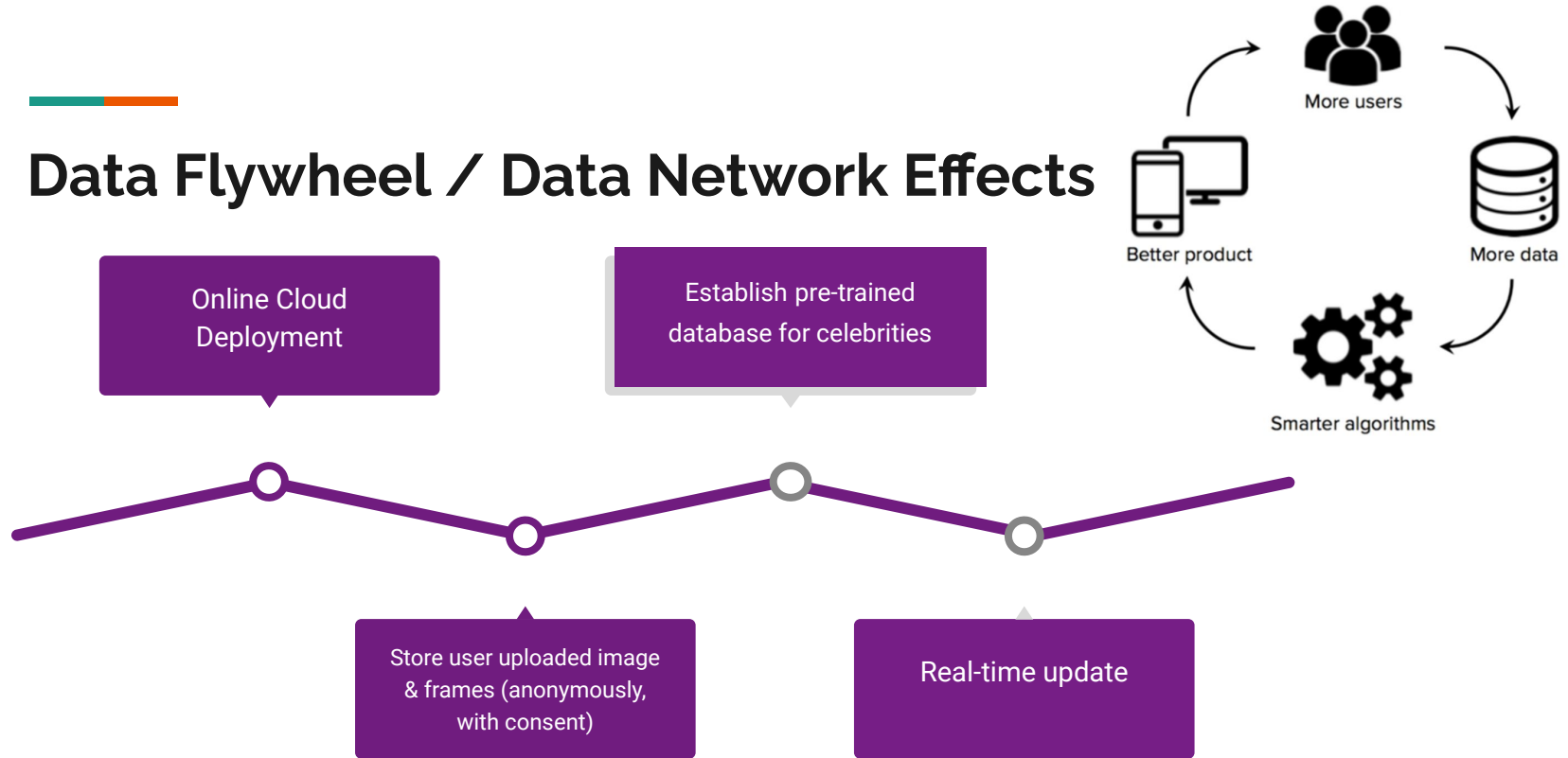
Euclidean L2

3. Distance Thresholds

For match ≤ 0.4

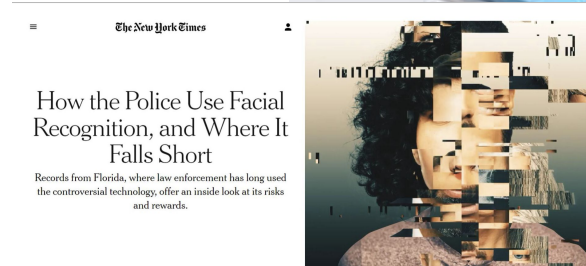
For update $\leq \text{match} * 0.6$

Data Flywheel / Data Network Effects



Ethics & Governance

1. Should we use user uploaded medias?
2. Are click-wrap agreements ethical?
3. How to ensure data security and privacy
4. Will future law enforcement uses lead to bias?
5. Will there be Copyright concerns?

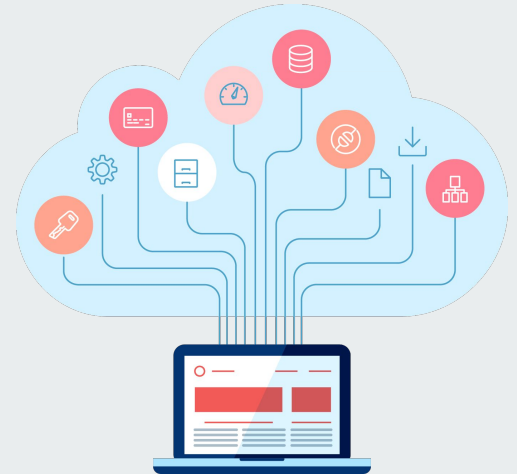


3 - Architecture

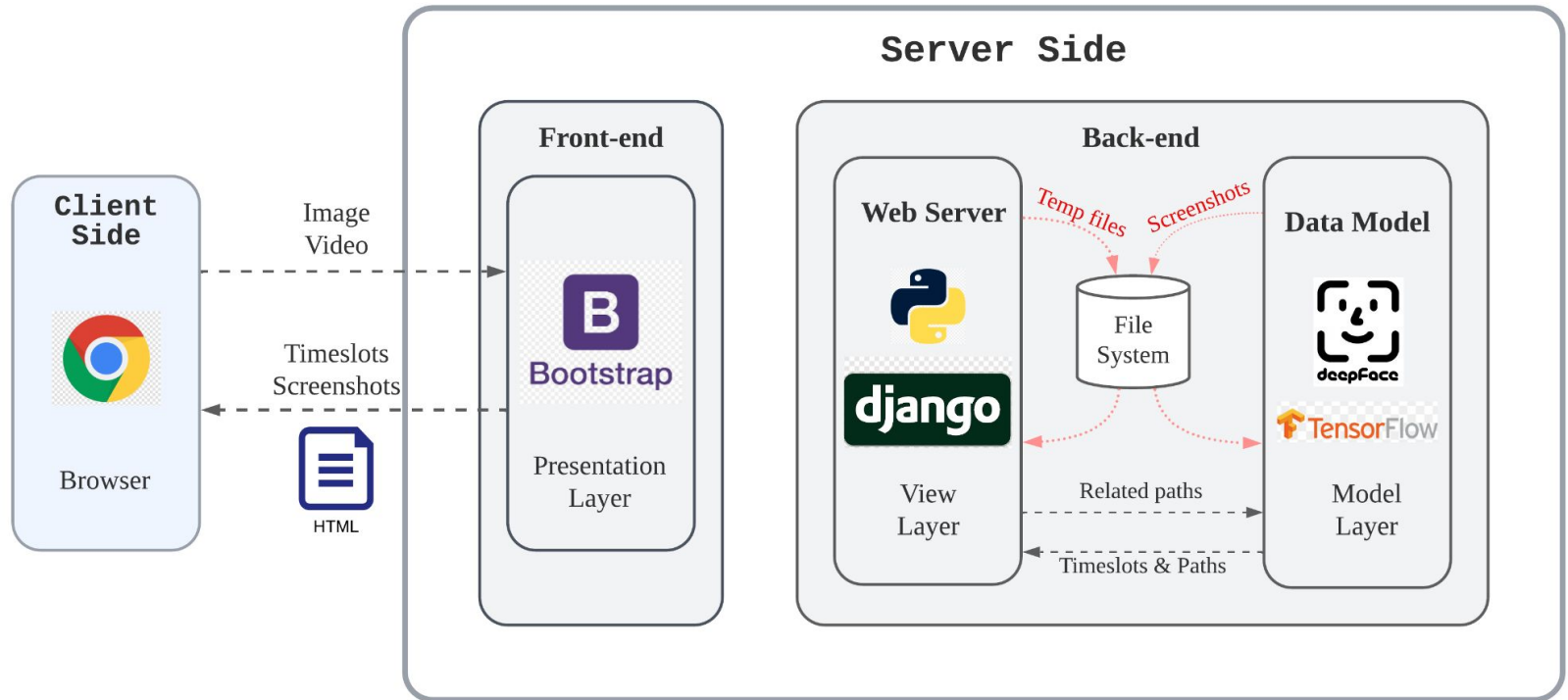
Current Architecture

Lesson Learned:

- Concern 1: Deployment & Scaling
- Concern 2: Data Pipeline
- Concern 3: Monitoring

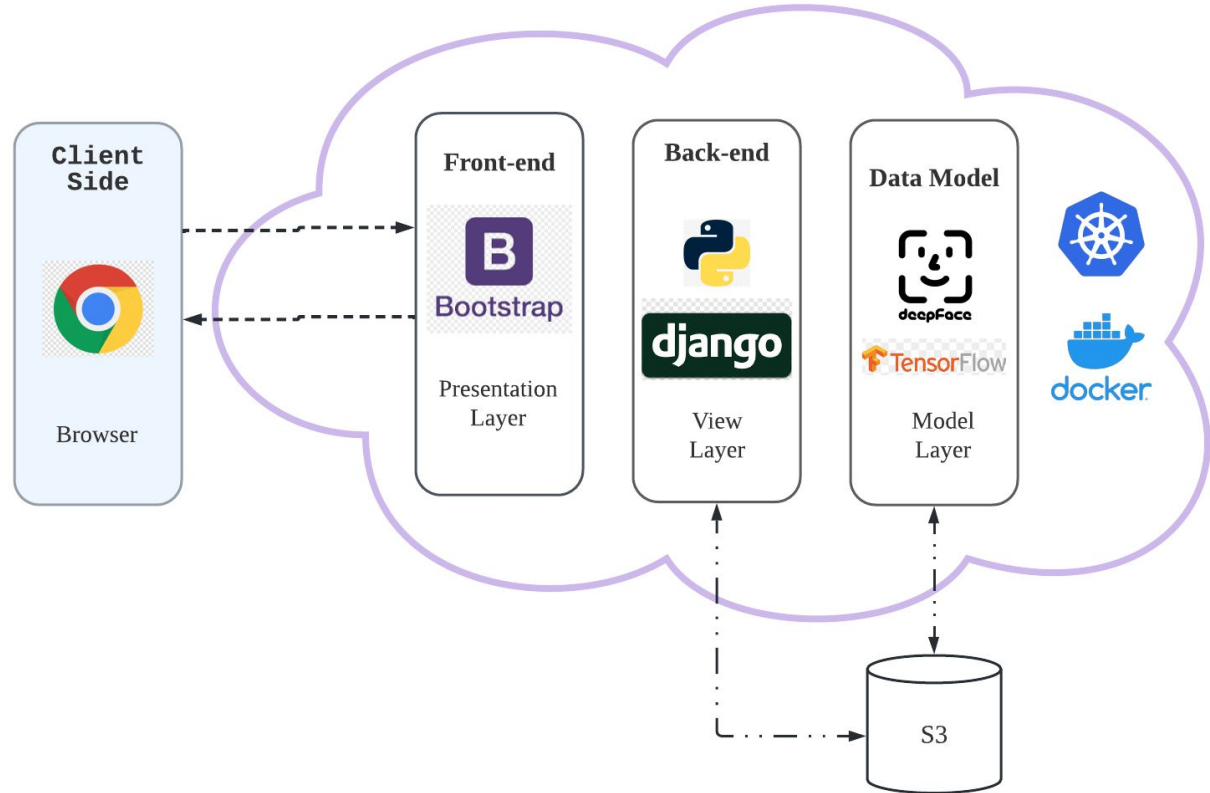


Architecture - Current



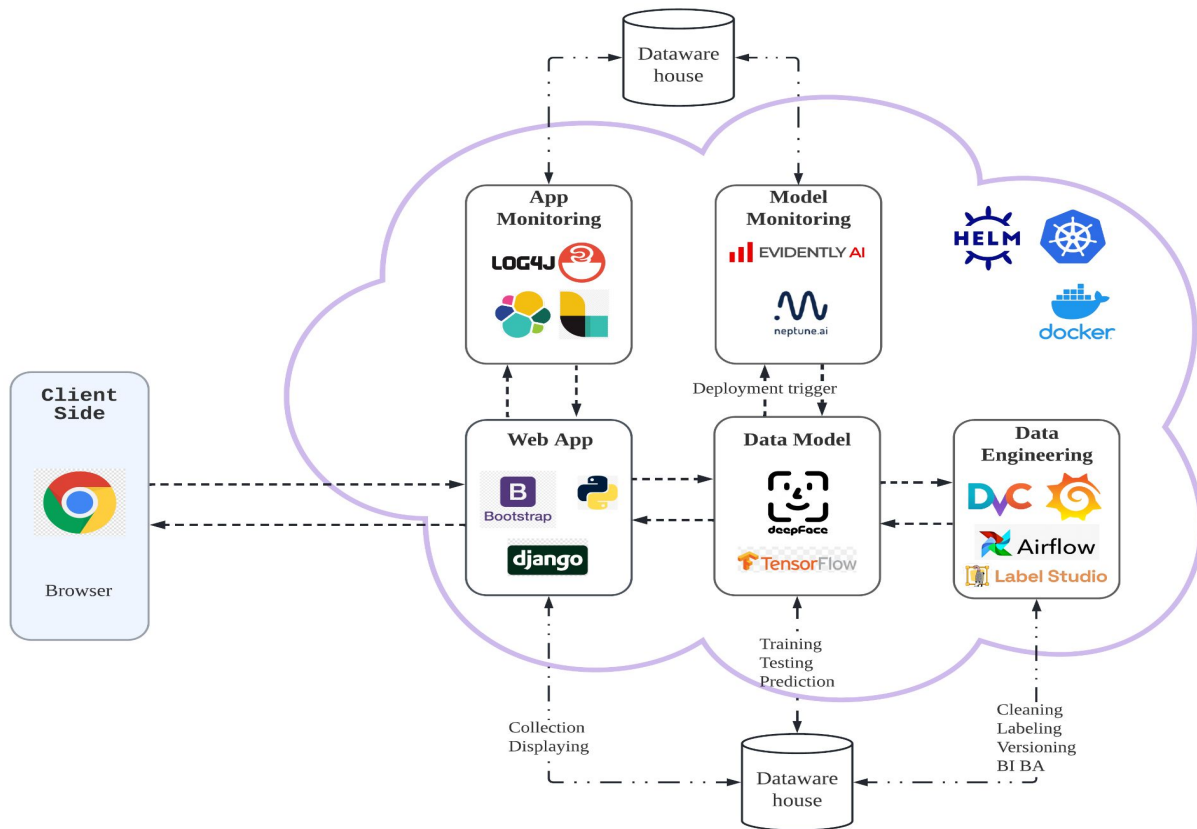
Architecture - Concern 1: Deployment & Scaling

1. Create **CICD** pipeline
2. Deploy to the **Cloud** and orchestrate using Kubernetes & Docker
3. **Network & performance:** VPC, Load Balancer, Scaling
4. Leverage **data warehouse** to replace local File System
5. Model is packed and deployed with the application



Architecture - Concern 3: Monitoring

1. **Model Metrics:** accuracy, precision, recall
2. **App Metrics:** system performance, errors, crashes
3. **Model Monitoring:** Evidently.ai, Neptune.ai, logs
4. **App Monitoring:** Kibana, Logstash, Prometheus...
5. Logs are integrated into separated databases
6. Keep improving!



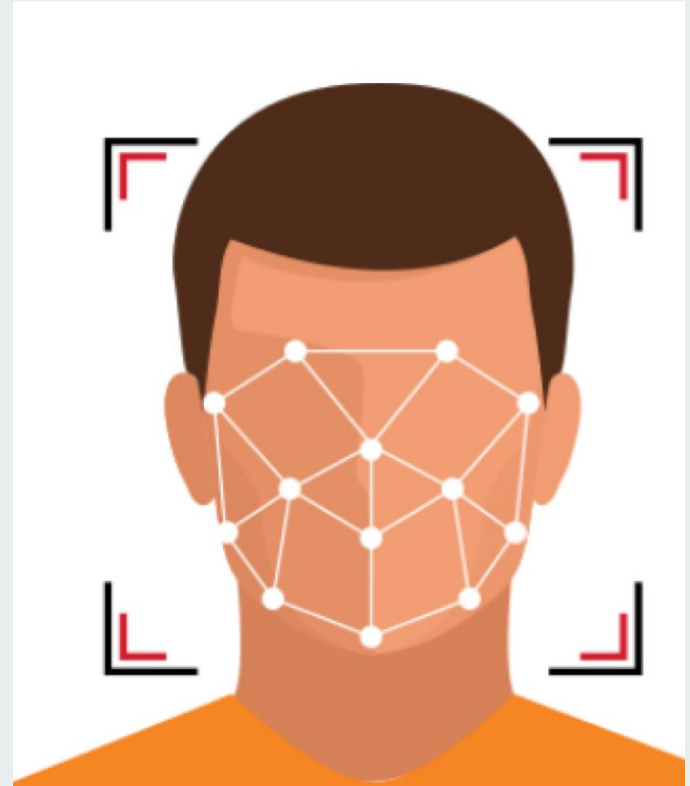
Demo

URL:

<https://github.com/makethedayunique/cmu-17691-facetracing-app>

Youtube:

<https://youtu.be/7nkgZSSvjhc>



Any Question?

Group 6:

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